

# Multi-Rover Coordination

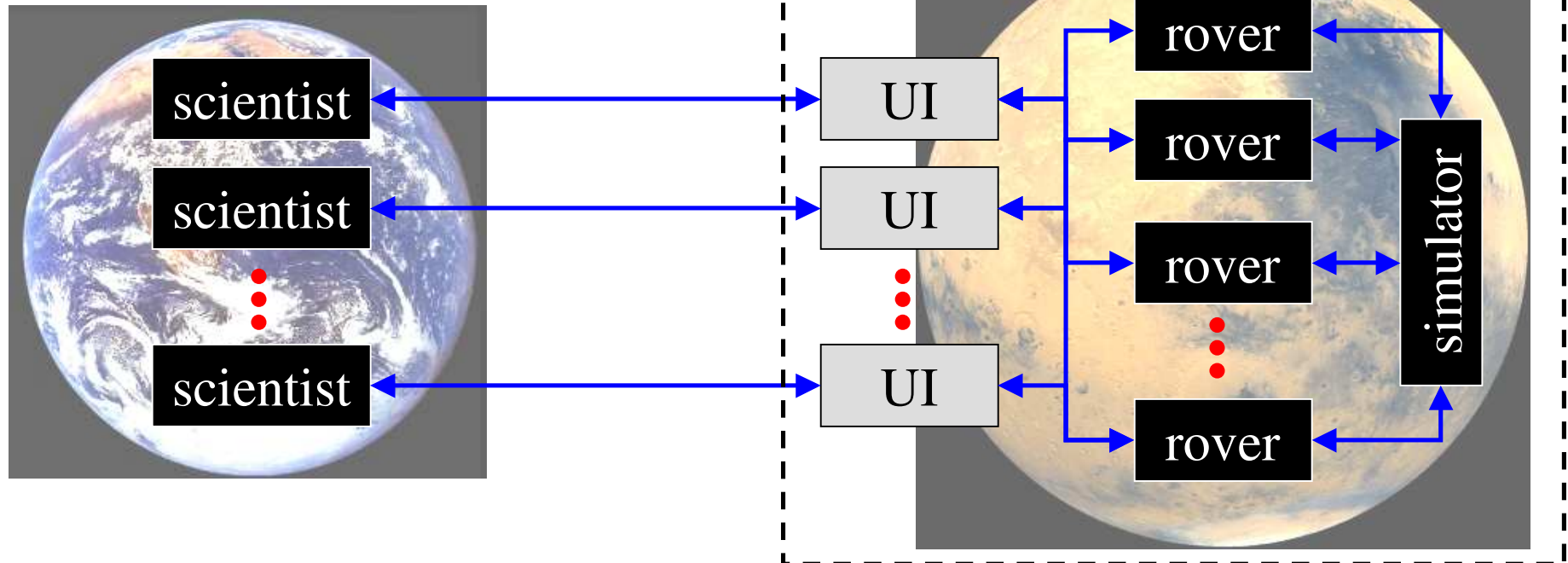
Automated Reasoning PI Workshop  
September 4, 2002

Reid Simmons, Stephen Smith,  
Anthony Stentz, Jeff Schneider,  
Dani Goldberg (presenter)

Robotics Institute  
Carnegie Mellon University



# Overview



- many scientists
- many tasks/goals
- relative priorities

- bandwidth
- blackouts

- interface
- broker
- "OpTrader"

- heterogeneous
- autonomous
- limited resources

# Scenario Overview



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# Year 1 Accomplishments

Distributed three-layered architecture

Multi-agent planning capability

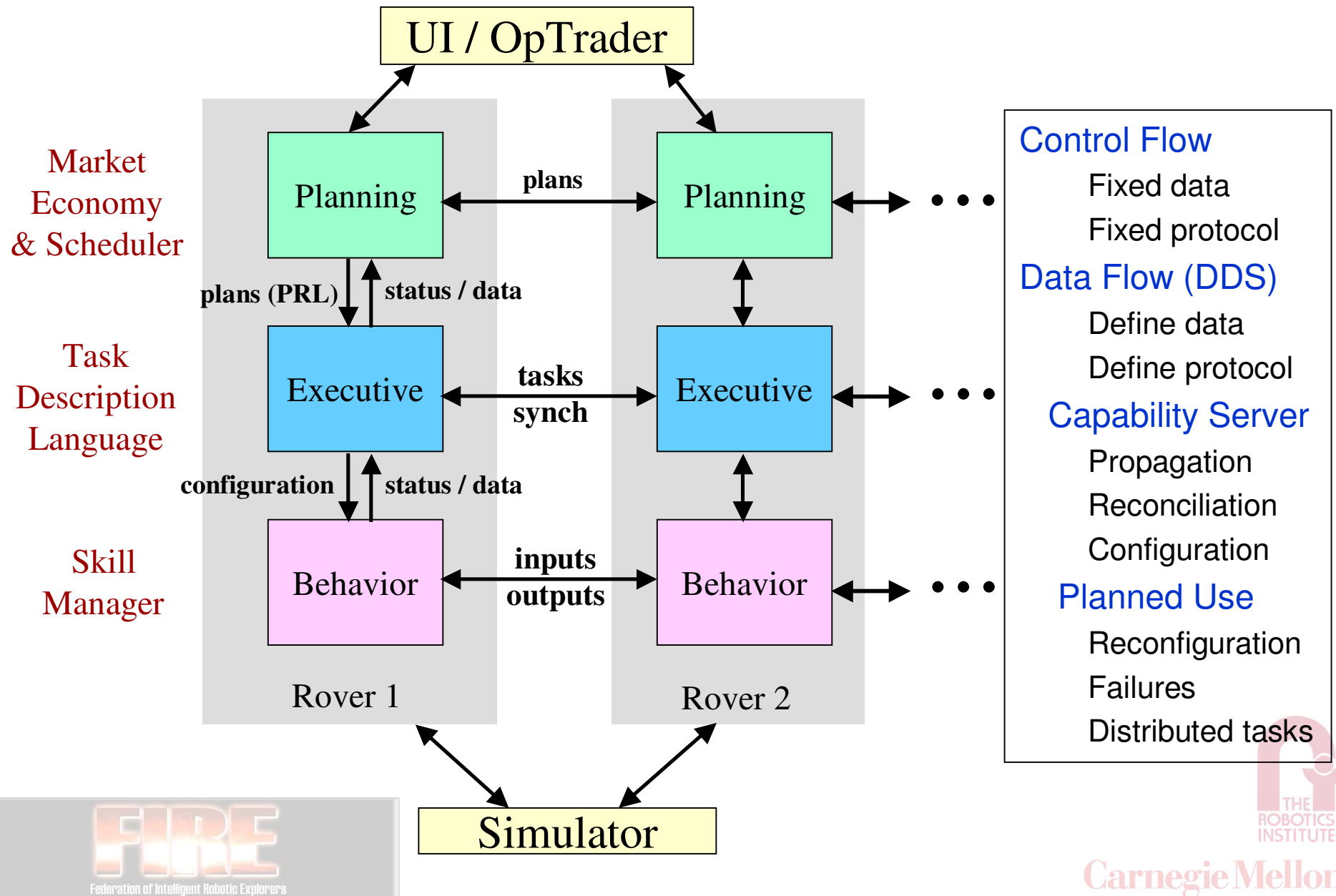
Simulator

Scenarios



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# Distributed Three-Layered Architecture



# Distributed Behavioral and Executive Layers

## Behavioral Layer

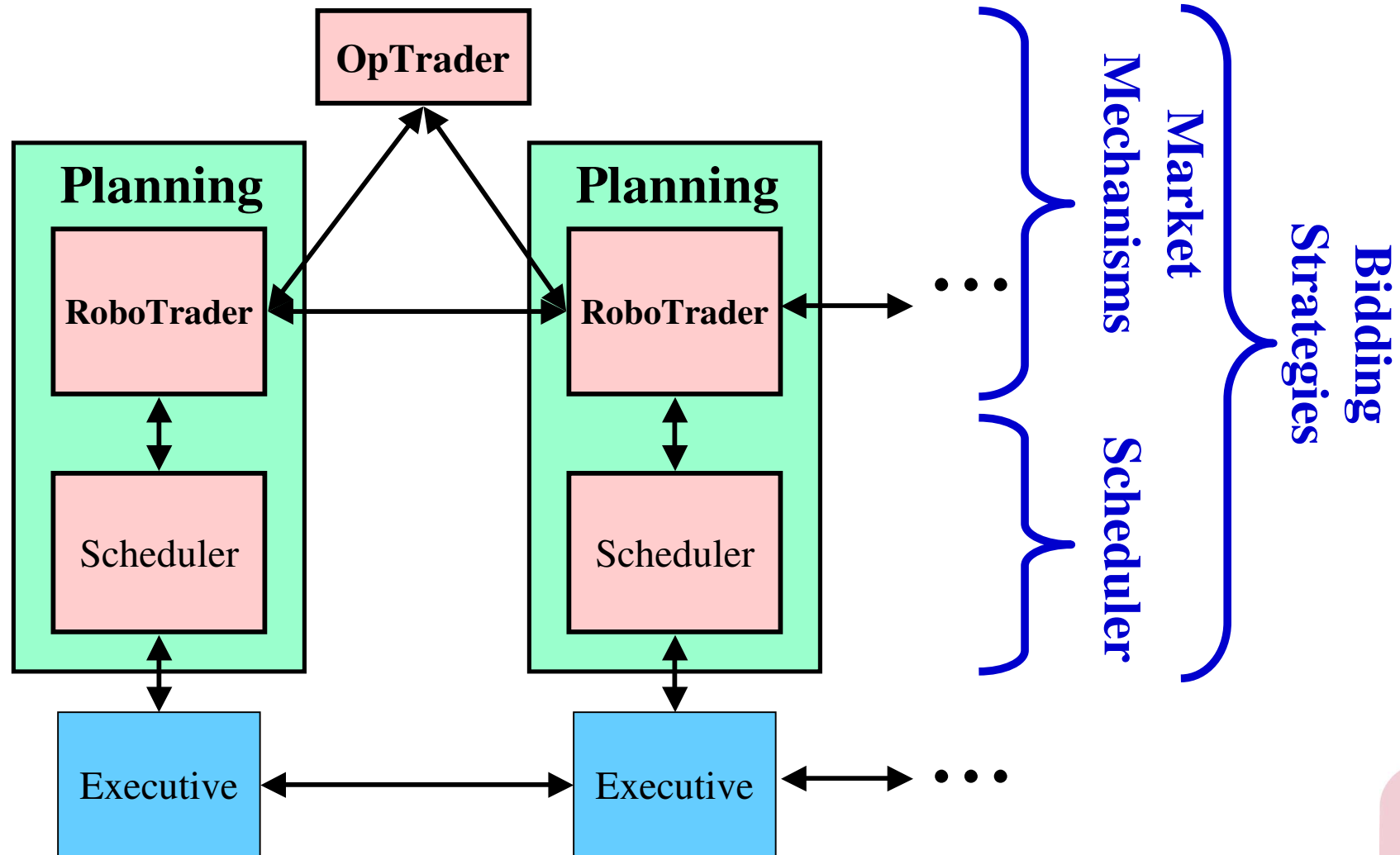
- Real-time sensor/effector feedback loops
- Efficient distributed servo loops (sensor/effector connections)
- Tightly coordinated controllers (effector/effector connections)

## Executive Layer

- Mediator between planning and behavioral layers
  - Receives distributed plans, translates them, establishes appropriate behavioral connections/functionality
- Task Description Language (TDL)
  - Hierarchical task decomposition, task synchronization, execution monitoring, exception handling
  - Recent improvements transparently handle task-level coordination between robots using message passing

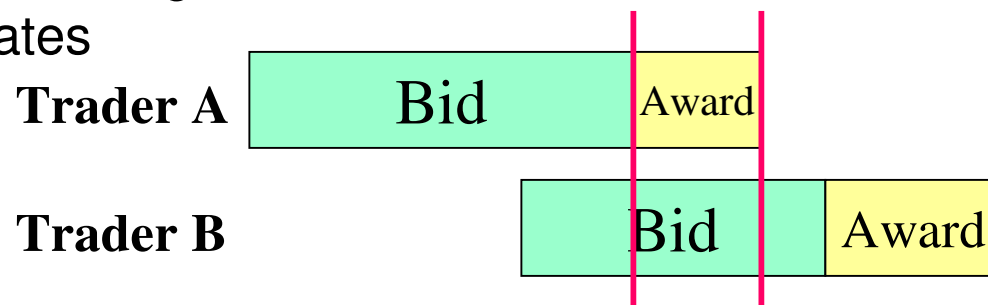
Future Extensions: full support of distributed tasks

# Multi-Agent Planning Capability



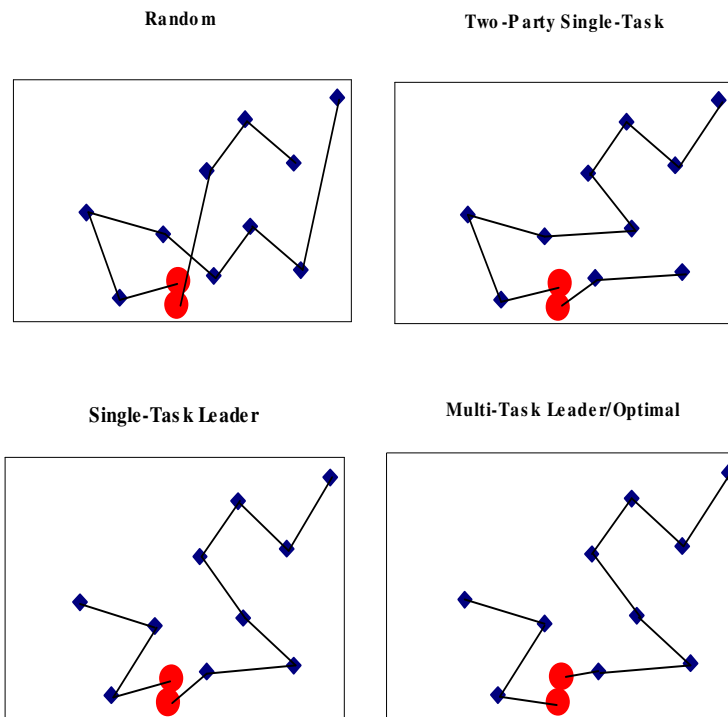
# Market Mechanisms

- Inter-Trader bidding
  - One Trader (auctioneer) make a call for bids on a task/tasks
  - Other Traders (bidders) send bids with costs
  - Auctioneer awards task(s) to bidder(s) with lowest costs
- Traders are continuously auctioning and bidding tasks
  - Tasks that are up for bid should not be executed
  - A Trader can simultaneously be a bidder and auctioneer only if the tasks it is bidding on are awarded before its own auction terminates





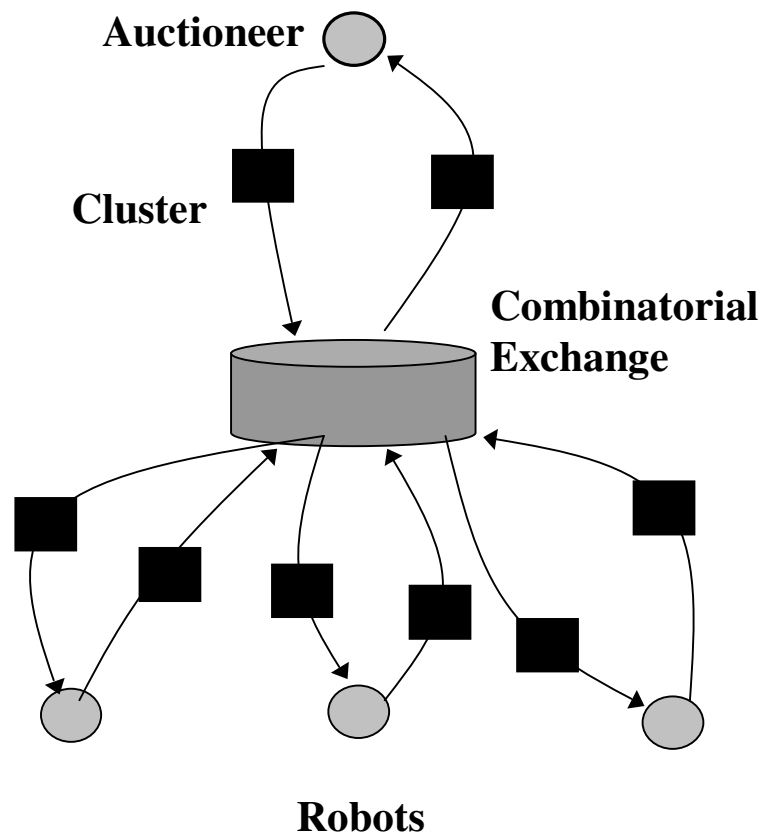
# Market Mechanisms: Leaders for Opportunistic Optimization



**Distributed TSP Problem**

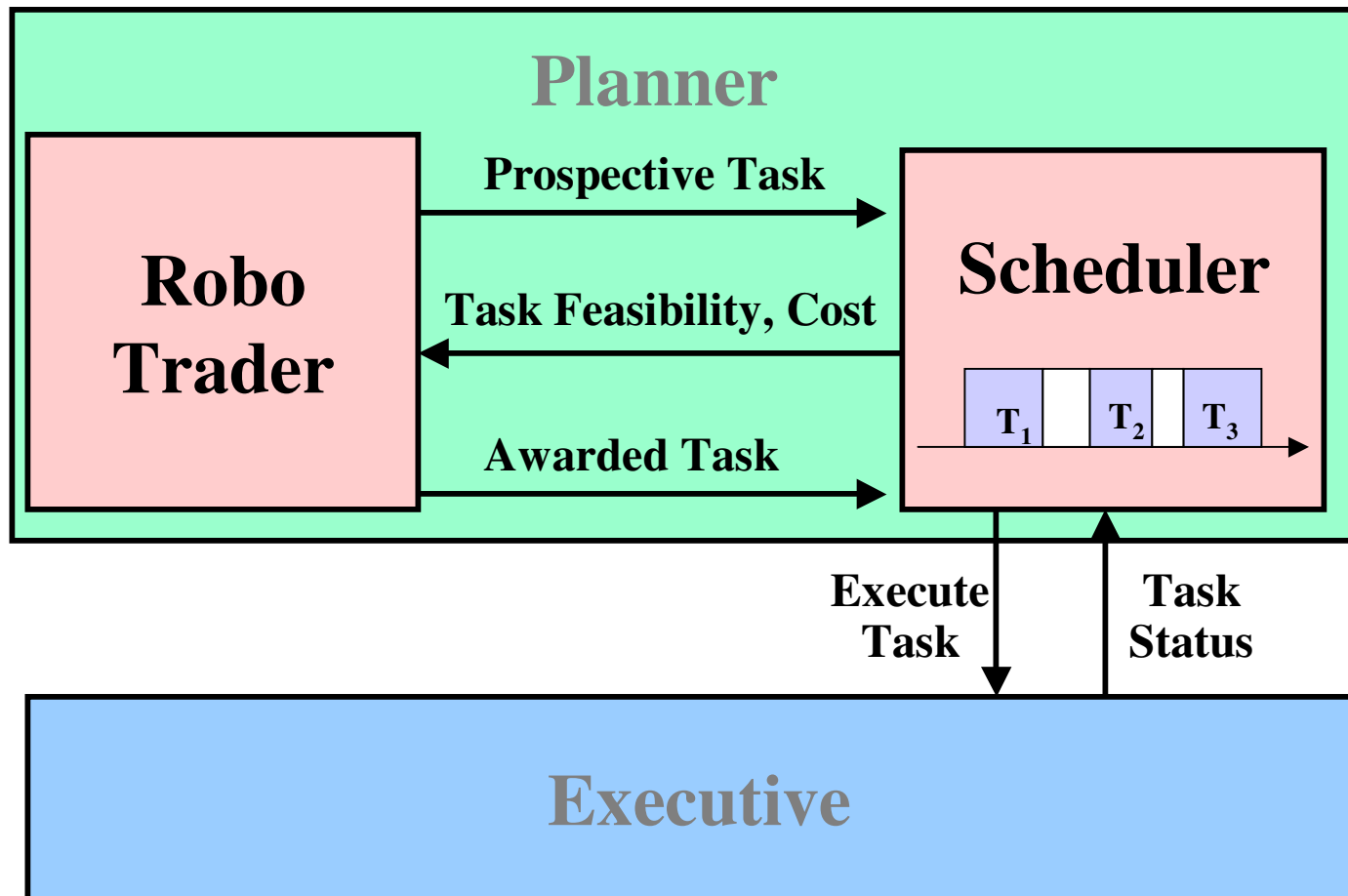
- Leaders generate plans requiring multi-agent participation and “sell” them in the market place.
- Cost-effective plans win in the market since they generate enough profit to “buy” participation.
- The optimization is opportunistic and local to the participating agents.
- The first leader implemented is a combinatorial exchange for multi-party and multi-task deals.

# Market Mechanisms: Task Clustering



- Tasks which can be executed cost effectively as a group are clustered.
- Agents form clusters and “buy/sell” them on the market.
- Clusters reduce the combinatorics of matching tasks to agents.

# Constructing Bids and Managing Execution



# Scheduler: Stochastic Amplification of Scheduling Search Heuristics

## Basic Idea (Cicirello & Smith, CP-02)

- Assume good scheduling heuristic
- Introduce randomness in the search when heuristic is less discriminating

## Desirable Characteristics

- Good solutions fast, with anytime properties if time permits
- Flexibility to incorporate a range of different heuristics

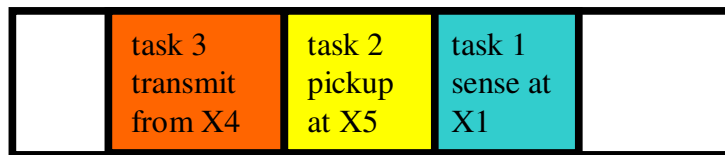
## Current Assumption: Scheduling problem formulated as TSP

## Planned Extensions

- Deadlines; time-windows
- Coordinated multi-rover tasks
- More sophisticated cost drivers
- Additional resource constraints

# Current Bidding Strategy: Estimated Time Cost

current schedule

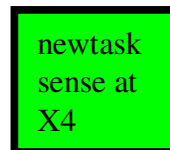


=> 38 time units

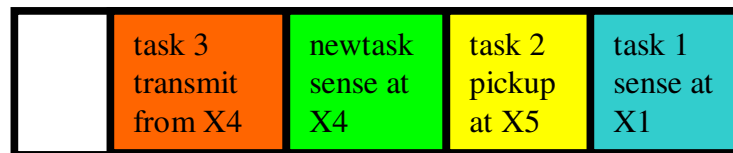
BID 10

Task is awarded  
to lowest bidder

new task available for bidding



hypothetical new schedule



=> 48 time units

## Advantages:

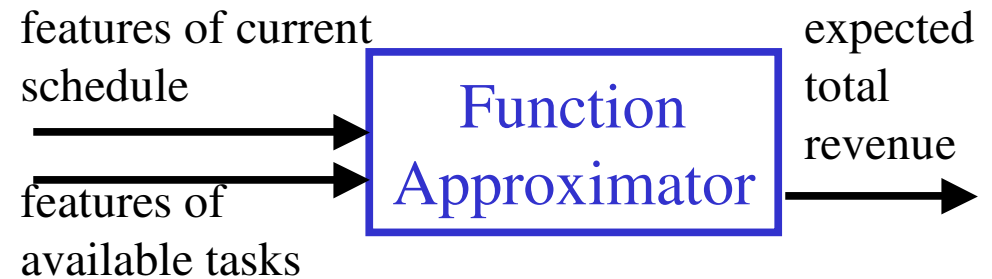
- simple to compute

## Disadvantages:

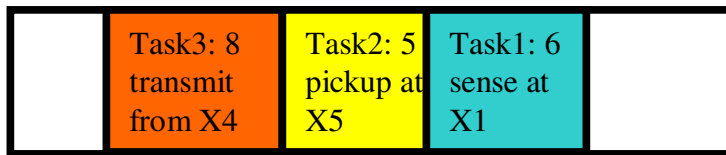
- ignores the value of the task
- ignores the value of other tasks that may be on offer

# Future Bidding Strategy: Estimated Opportunity Cost

Learn an “expected revenue” function approximator with data from simulation runs



current schedule

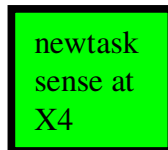


=> estimated revenue: 24

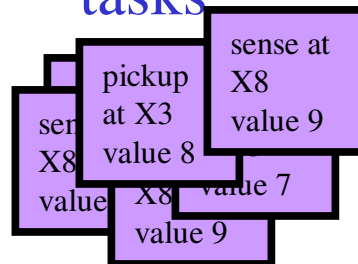
BID 24 - 19 = 5

lowest bid is accepted if it does not exceed task value

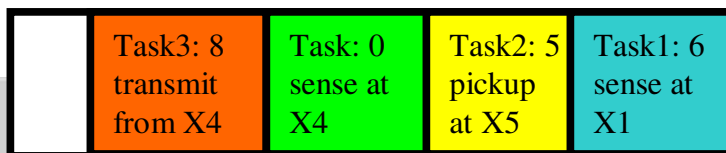
new task available for bidding



other remaining tasks



hypothetical new schedule (do new task for free)

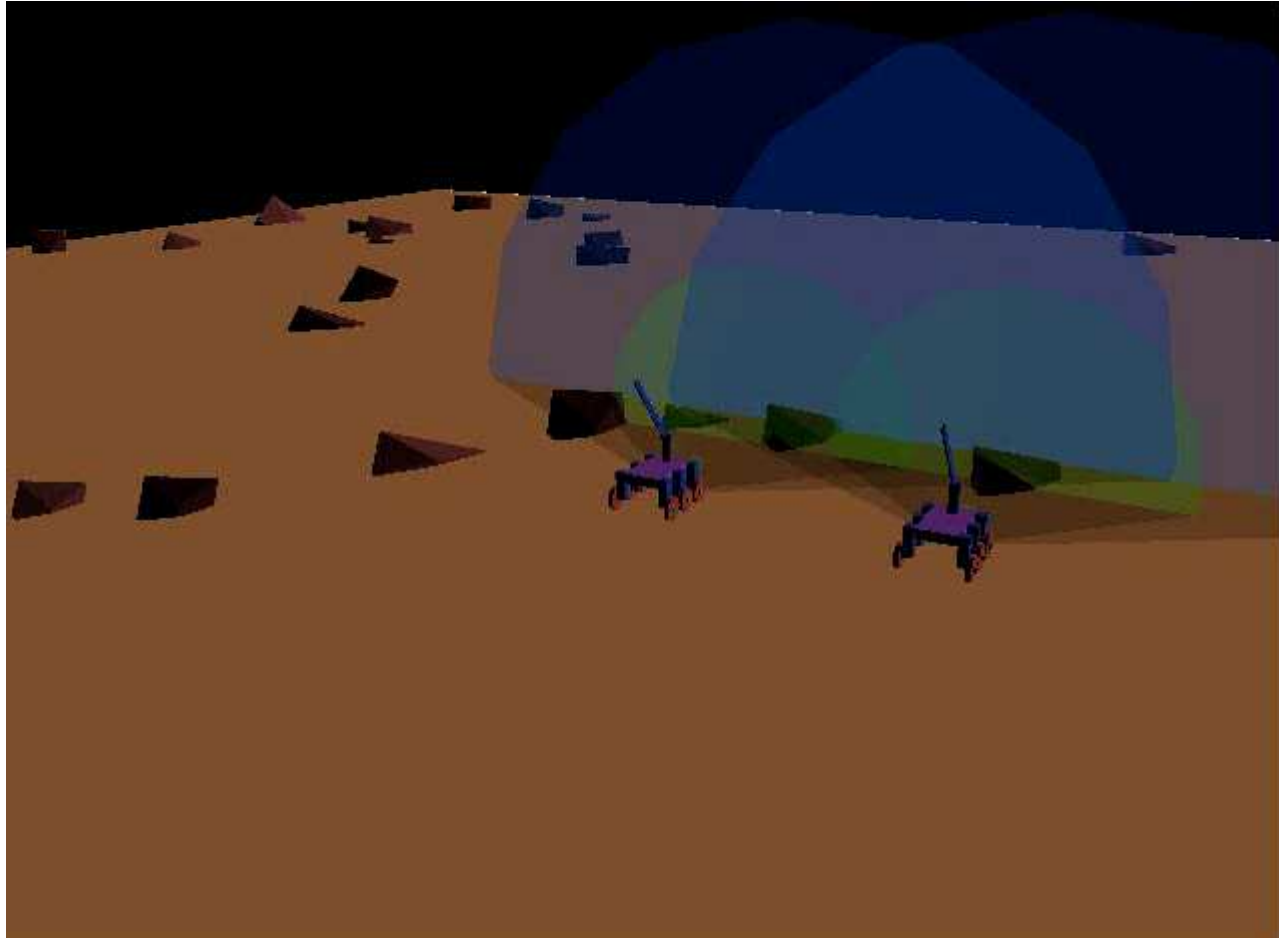


=> estimated revenue: 19

Remaining issues:

- choice of function approximator
- efficient computation

# In Action...



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# Continuing Work

- “ComTask” problem
  - Maintain a communications network between the rovers based on limited range, line of sight communications equipment.
- Planning based on the value of information
  - Plan to maximize information gain
- Experimental Plan
  - Experiments
    - Vary market parameters
    - Vary task structure
    - Vary environment
  - Performance Data
    - % rocks collected, activity of agents, total cost decline



# Personnel

## PI's

- Reid Simmons
- Anthony Stentz
- Stephen Smith
- Jeff Schneider

## Postdocs

- Dani Goldberg

## Research Programmers

- David Apfelbaum

## Graduate Students

- Drew Bagnell
- Vincent Cicirello
- M. Bernardine Dias
- Maayan Roth
- Brennan Sellner
- Trey Smith

## Undergraduate Students

- Stuart Anderson

[www.cs.cmu.edu/~fire](http://www.cs.cmu.edu/~fire)



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# Heterogeneous Multi-Rover Coordination

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**Goal:** Provide capabilities for multiple, heterogeneous robots to coordinate activities autonomously, efficiently, and reliably.

## Objectives:

- Develop architectural framework for exploring tradeoffs between planning, negotiation, sensing, and action.
- Demonstrate utility of heterogeneous teams of robots to perform coordinated tasks autonomously and reliably.

## Key Innovations:

- Market-based architecture for team formation, resource allocation.
- Distributed global planning and task execution.
- Explicit tradeoffs between planning, sensing, and execution.
- Probabilistic reasoning and learning algorithms for sensing and task execution.

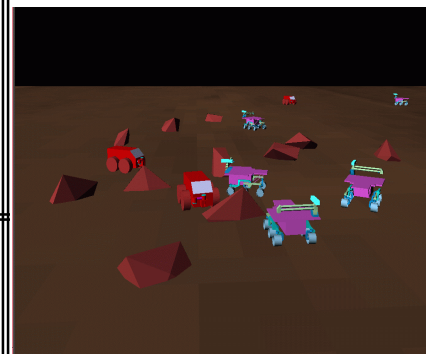
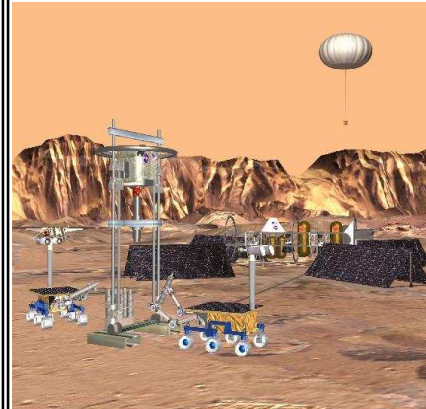
## NASA Relevance:

- Future space missions, such as Mars exploration or in-space assembly, will benefit from teams of autonomous robots. Heterogeneous teams will be more capable and reliable than similarly sized homogeneous robots.

## Accomplishments to date:

- Developed multi-rover graphical simulator.
- Implemented initial, coordinated task execution functionality.
- Defined/implementing market-based architectural framework.
- Provided initial scheduling/planning capabilities.
- Developed detailed Mars rover exploration scenario.
- Demonstrated market/scheduler interaction for task allocation.

## Description



- **Market-Based Architecture:** Use distributed bidding techniques to form teams, allocate tasks, and deal with changing conditions.
- **Global Coordination:** Use both distributed and centralized planning and scheduling to efficiently create highly optimal plans for multiple agents.
- **Coordinated Task Execution:** Use distributed task synchronization and monitoring to enable teams of robots to perform tasks that none can do individually.
- **Valuing Sensor Actions and Plans:** Use information and decision theoretic techniques to make trade offs in when, what, and how to sense, and cost/value potential plans.

## Schedule:

- FY 02: Distributed multi-layer architecture; multi-rover planning capability.
- FY 03: Extension to complex tasks requiring explicit multi-rover coordination in planning and execution.
- FY 04: Incorporate value of information into planning; expansion to more complex scenarios; experimentation and validation.

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